

Portfolio Hedging with Futures - Analysis Walkthrough

BU623 Derivatives | Wilfrid Laurier University | TQM Hedge Fund Case Study

Executive Summary

TQM Hedge Fund manages **\$1.035 billion** across four regional equity portfolios. This analysis recommends the **Firm-Wide 3-Factor Hedge**:

- **Adj R² = 92.65%** (single regression, directly interpretable)
 - **3 futures only** (lowest management cost)
 - **Contracts:** 2,256 S&P 500 + 4,640 FTSE EM + 1,644 Nikkei (short)
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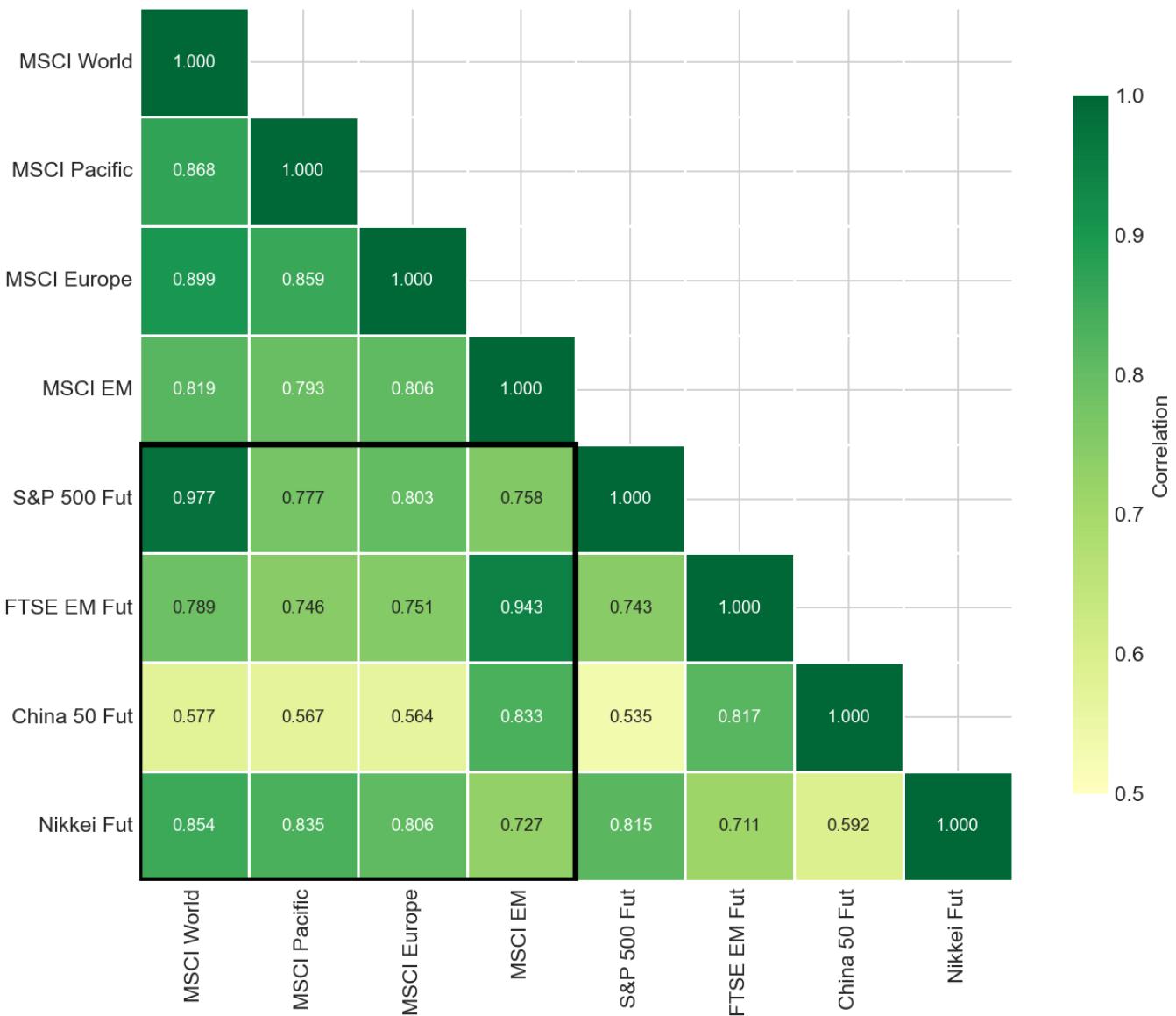
1. Portfolio Overview

| Portfolio | Index | Value (\$) | Weight |
|--------------|---------------|----------------------|--------|
| MSCI World | Global DM | 500,000,000 | 48.3% |
| MSCI EM | Emerging Mkts | 200,000,000 | 19.3% |
| MSCI Europe | European DM | 175,000,000 | 16.9% |
| MSCI Pacific | Asia-Pacific | 160,000,000 | 15.5% |
| Total | | 1,035,000,000 | 100% |

2. Correlation Analysis

The correlation heatmap shows the relationship between index returns and futures returns:

Cross-Correlation Heatmap: Index Returns vs Futures Returns



Key Observations:

- MSCI World ↔ S&P 500: **0.977** (very high - direct hedge)
- MSCI EM ↔ FTSE EM: **0.943** (very high - direct hedge)
- MSCI Europe ↔ S&P 500: **0.803** (moderate - cross-hedge)
- MSCI Pacific ↔ Nikkei: **0.835** (high - direct hedge)

The black box highlights the key cross-correlations between futures (rows) and indices (columns).

3. Contract Calculation Methodology

Formula

The optimal number of futures contracts is:

$$N^* = h^* \times (V_S / V_F)$$

Where:

- N^* = Optimal number of contracts
- h^* = Hedge ratio (beta from regression)
- V_S = Value of spot position (portfolio value)
- V_F = Value of one futures contract = Futures Price \times Multiplier

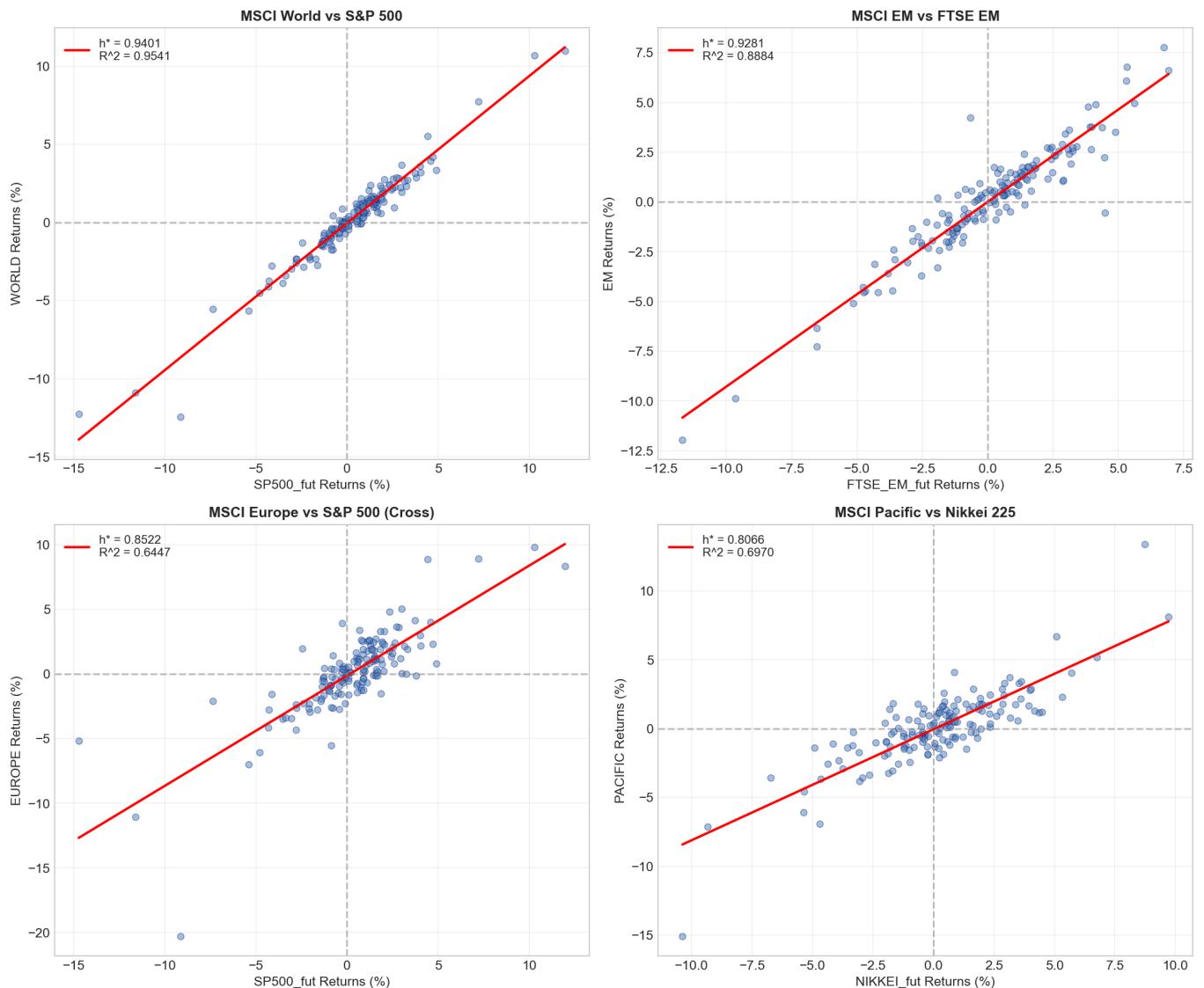
Contract Specifications

| Future | Multiplier | Price | Contract Value (\$V_F\$) |
|----------|------------|-------------|--------------------------|
| S&P 500 | 50 | \$4,202.50 | \$210,125 |
| FTSE EM | 100 | \$668.30 | \$66,830 |
| China 50 | 2 | \$20,487.50 | \$40,975 |
| Nikkei | 5 | \$29,020.00 | \$145,100 |

4. Single-Future Hedging

Scatter Plots with Regression Lines

Index Returns vs Futures Returns with Optimal Hedge Ratio (h^*)



Regression Summary

| Portfolio | Futures | $h^* (\beta)$ | R^2 | t-stat | Contracts | Value (\$M) |
|--------------|---------|---------------|--------|--------------|-----------|---------------|
| MSCI World | S&P 500 | 0.9401 | 95.41% | 56.79 | 2,237 | 470 |
| MSCI EM | FTSE EM | 0.9281 | 88.84% | 35.12 | 2,777 | 186 |
| MSCI Europe | S&P 500 | 0.8522 | 64.47% | 16.77 | 710 | 149 |
| MSCI Pacific | Nikkei | 0.8066 | 69.70% | 18.88 | 889 | 129 |
| TOTAL | | | | 6,613 | | \$934M |

5. 4-Factor Regression (Feature Selection)

4-Factor Regression Results (* = p < 0.05)
Used to identify significant futures for multi-future hedging

| Portfolio | Adj R ² | SP500 β | SP500 t | FTSE_EM β | FTSE_EM t | CHINA50 β | CHINA50 t | NIKKEI β | NIKKEI t |
|--------------|--------------------|---------|---------|-----------|-----------|-----------|-----------|----------|----------|
| MSCI World | 0.9689 | 0.7417* | 28.03 | 0.1511* | 4.64 | -0.0417 | -1.68 | 0.1517* | 5.74 |
| MSCI EM | 0.9096 | 0.1360* | 3.16 | 0.6265* | 11.84 | 0.2034* | 5.05 | 0.0242 | 0.56 |
| MSCI Europe | 0.7368 | 0.2999* | 3.53 | 0.3931* | 3.76 | -0.1068 | -1.34 | 0.4408* | 5.19 |
| MSCI Pacific | 0.7491 | 0.1194 | 1.69 | 0.3471* | 3.99 | -0.1070 | -1.62 | 0.5239* | 7.42 |

5.1 MSCI World - Model Summary

| Future | β (h*) | t-stat | p-value | Significant? |
|---------|---------|--------|---------|--------------|
| SP500 | 0.7417 | 28.03 | <0.001 | ✓ Yes |
| FTSE_EM | 0.1511 | 4.64 | <0.001 | ✓ Yes |
| CHINA50 | -0.0417 | -1.68 | 0.094 | No |
| NIKKEI | 0.1517 | 5.74 | <0.001 | ✓ Yes |

Adj R² = 96.89% | Significant: SP500, FTSE_EM, NIKKEI

5.2 MSCI EM - Model Summary

| Future | β (h*) | t-stat | p-value | Significant? |
|---------|--------|--------|---------|--------------|
| SP500 | 0.1360 | 3.16 | 0.002 | ✓ Yes |
| FTSE_EM | 0.6265 | 11.84 | <0.001 | ✓ Yes |
| CHINA50 | 0.2034 | 5.05 | <0.001 | ✓ Yes |
| NIKKEI | 0.0242 | 0.56 | 0.574 | No |

Adj R² = 90.96% | Significant: SP500, FTSE_EM, CHINA50

5.3 MSCI Europe - Model Summary

| Future | β (h*) | t-stat | p-value | Significant? |
|---------|---------|--------|---------|--------------|
| SP500 | 0.3000 | 3.53 | <0.001 | ✓ Yes |
| FTSE_EM | 0.3931 | 3.76 | <0.001 | ✓ Yes |
| CHINA50 | -0.1068 | -1.34 | 0.181 | No |
| NIKKEI | 0.4408 | 5.19 | <0.001 | ✓ Yes |

Adj R² = 73.68% | Significant: SP500, FTSE_EM, NIKKEI

5.4 MSCI Pacific - Model Summary

| Future | β (h*) | t-stat | p-value | Significant? |
|---------|--------------|--------|---------|--------------|
| SP500 | 0.1194 | 1.69 | 0.093 | No |
| FTSE_EM | 0.3471 | 3.99 | <0.001 | ✓ Yes |
| CHINA50 | -0.1070 | -1.62 | 0.108 | No |
| NIKKEI | 0.5239 | 7.42 | <0.001 | ✓ Yes |

Adj R² = 74.91% | Significant: FTSE_EM, NIKKEI

6. Multi-Future Decision Analysis

Based on the 4-factor results, we evaluate whether adding futures improves R² enough to justify added complexity and contracts.

6.1 MSCI World Decision

| Model | Adj R ² | Futures | h* Values | Contracts | Value |
|---------------|--------------------|----------------------|----------------|-----------------|--------|
| Single | 95.41% | SP500 | 0.9401 | 2,237 | \$470M |
| 3-Factor | 96.89% | SP500+FTSE_EM+NIKKEI | 0.74/0.15/0.15 | 1,765+1,130+523 | \$740M |

Decision: Use Single Hedge (S&P 500)

- +1.48pp R² improvement not worth +\$270M contract value
- ✓ Simpler, lower margin

6.2 MSCI EM Decision

| Model | Adj R ² | Futures | h* Values | Contracts | Value |
|---------------|--------------------|-----------------------|----------------|---------------|--------|
| Single | 88.84% | FTSE_EM | 0.9281 | 2,777 | \$186M |
| 3-Factor | 90.96% | SP500+FTSE_EM+CHINA50 | 0.14/0.63/0.20 | 133+1,876+993 | \$109M |

Decision: Use Single Hedge (FTSE EM)

- +2.12pp R² improvement
- 3-factor actually reduces contract value but adds complexity
- ✓ Adequate R² with simpler execution

6.3 MSCI Europe Decision

| Model | Adj R ² | Futures | h* Values | Contracts | Value |
|-------|--------------------|---------|-----------|-----------|-------|
| | | | | | |

| Model | Adj R ² | Futures | h* Values | Contracts | Value |
|-----------------|--------------------|----------------------|----------------|---------------|--------|
| Single | 64.47% | SP500 | 0.8522 | 710 | \$149M |
| 2-Factor | ~72% | SP500+NIKKEI | 0.46/0.51 | 384+617 | \$170M |
| 3-Factor | 73.68% | SP500+FTSE_EM+NIKKEI | 0.30/0.39/0.44 | 250+1,029+531 | \$181M |

Decision: Use 2-Factor (S&P 500 + Nikkei)

- Single hedge has high basis risk (64.47% R²)
- 2-factor improves to ~72% with manageable contract increase
- 3-factor adds FTSE_EM for only ~1.5pp more - diminishing returns

6.4 MSCI Pacific Decision

| Model | Adj R ² | Futures | h* Values | Contracts | Value |
|-----------------|--------------------|----------------|-----------|-----------|--------|
| Single | 69.70% | NIKKEI | 0.8066 | 889 | \$129M |
| 2-Factor | 74.91% | FTSE_EM+NIKKEI | 0.30/0.60 | 715+657 | \$143M |

Decision: Use 2-Factor (FTSE_EM + Nikkei)

- +5.2pp R² improvement is meaningful
- Contract value increase modest (\$14M)
- Captures both EM and Japan exposure

6.5 Multi-Future Summary

| Portfolio | Model | Futures | Contracts | Value |
|--------------|----------|------------------|--------------|---------------|
| MSCI World | Single | SP500 | 2,237 | \$470M |
| MSCI EM | Single | FTSE_EM | 2,777 | \$186M |
| MSCI Europe | 2-Factor | SP500 + NIKKEI | 384 + 617 | \$170M |
| MSCI Pacific | 2-Factor | FTSE_EM + NIKKEI | 715 + 657 | \$143M |
| TOTAL | | 6 futures | 7,387 | \$969M |

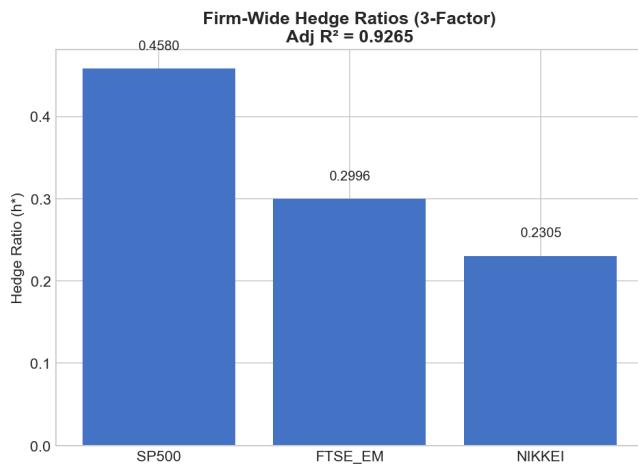
7. Firm-Wide Portfolio Hedge

7.1 Why Firm-Wide?

Instead of hedging each portfolio separately (6 futures), we hedge the entire \$1.035B as one unit:

- **Diversification benefit:** Portfolio correlations reduce overall risk
- **Fewer futures (3):** Lower management cost
- **Single R² metric:** Directly interpretable

7.2 3-Factor Model (Excludes Insignificant China50)



Firm-Wide Contracts (3-Factor)
Total Portfolio: \$1035M

| Future | h* | Contracts | Value |
|---------|--------|-----------|----------|
| SP500 | 0.4580 | 2256 | \$474.0M |
| FTSE_EM | 0.2996 | 4640 | \$310.1M |
| NIKKEI | 0.2305 | 1644 | \$238.5M |

| Future | β (h*) | t-stat | Contracts | Value |
|--------------|--------|--------|--------------|-----------------|
| SP500 | 0.4580 | *** | 2,256 | \$474M |
| FTSE_EM | 0.2996 | *** | 4,640 | \$310M |
| NIKKEI | 0.2305 | *** | 1,644 | \$239M |
| TOTAL | | | 8,540 | \$1,023M |

Adj R² = 92.65%

Contract Calculation

$$N^*(SP500) = 0.4580 \times (1,035,000,000 / 210,125) = 2,256 \text{ contracts}$$

$$N^*(FTSE_EM) = 0.2996 \times (1,035,000,000 / 66,830) = 4,640 \text{ contracts}$$

$$N^*(NIKKEI) = 0.2305 \times (1,035,000,000 / 145,100) = 1,644 \text{ contracts}$$

8. Strategy Comparison

Strategy Comparison: Fewer Futures = Lower Management Cost
(Green = Recommended)

| Strategy | # Futures | Contract Value | Notes |
|------------------------------|-----------|----------------|---|
| Single-Future (4 portfolios) | 4 | \$934M | Simple, 1 future per portfolio |
| Multi-Future (Handpicked) | 6 | \$969M | World/EM: single; Europe/Pacific: 2-factor |
| Firm-Wide 4-Factor | 4 | \$1053M | Adj R ² =92.61%, includes insig. China50 |
| Firm-Wide 3-Factor | 3 | \$1023M | Adj R ² =92.65%, RECOMMENDED |

| Strategy | # Futures | Contracts | Value | Notes |
|---------------|-----------|-----------|--------|-----------------|
| Single-Future | 4 | 6,613 | \$934M | 1 per portfolio |

| Strategy | # Futures | Contracts | Value | Notes |
|---------------------|-----------|--------------|-----------------|---------------------------------|
| Multi-Future | 6 | 7,387 | \$969M | Handpicked |
| Firm-Wide 4F | 4 | ~10,377 | \$1,053M | Includes China50 |
| Firm-Wide 3F | 3 | 8,540 | \$1,023M | Adj R²=92.65% |

Key Insight: Firm-Wide 3-Factor achieves the highest Adj R² (92.65%) with fewest futures (3).

9. Conclusion & Recommendation

Recommended: **Firm-Wide 3-Factor Hedge**

| Metric | Value |
|--------------------------|-----------------|
| Adj R² | 92.65% |
| # Futures | 3 |
| Contracts | 8,540 |
| Contract Value | \$1,023M |

Final Position (Short)

| Future | h* | Contracts | Value |
|--------------|--------|--------------|-----------------|
| S&P 500 | 0.4580 | 2,256 | \$474M |
| FTSE EM | 0.2996 | 4,640 | \$310M |
| Nikkei | 0.2305 | 1,644 | \$239M |
| TOTAL | | 8,540 | \$1,023M |

Why Firm-Wide 3-Factor is Optimal:

1. **Highest Adj R² (92.65%)** - Best hedge effectiveness
 2. **Fewest Futures (3)** - Minimal management complexity
 3. **Lower Margin** - Fewer positions = less capital
 4. **Diversification** - Benefits from portfolio correlations
 5. **No Irrational Positions** - Excludes insignificant China50
-

Appendix: Files Generated

| File | Description |
|----------------------------|----------------------------------|
| 01_correlation_heatmap.png | Index-futures correlation matrix |
| 02_scatter_plots.png | Single-future regression plots |

| File | Description |
|----------------------------|-----------------------------|
| 05_four_factor_table.png | 4-factor regression results |
| 07_firmwide_summary.png | Firm-wide hedge summary |
| 09_strategy_comparison.png | Strategy comparison chart |
| all_contracts.csv | All contract calculations |

How to Reproduce

```
python hedging_analysis.py
```